

```
In [1]: pip install yfinance

Collecting yfinance
  Downloading yfinance-0.2.41-py2.py3-none-any.whl (73 kB)
    Downloading requests-2.32.3-py3-none-any.whl (64 kB)
    Downloading pandas-1.3.0-py3-none-any.whl (4.4 MB)
    Collecting lxml-4.9.1
    Downloading lxml-4.9.1-cp39-cp39-macosx_10_9_x86_64.whl (4.4 MB)
    Downloading numpy-1.24.1-py2.py3-none-any.whl (505 kB)
    Downloading htmllib-1.1
    Downloading htmllib-1.1-py2.py3-none-any.whl (112 kB)
    Collecting multitasking-0.0.7
    Downloading multitasking-0.0.11-py3-none-any.whl (8.5 kB)
Requirement already satisfied: pandas>=1.3.0 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from yfinance) (1.4.2)
Collecting platformdirs<2.0.0
  Downloading platformdirs-4.2.2-py3-none-any.whl (18 kB)
Requirement already satisfied: beautifulsoup4>=4.11.1 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from yfinance) (4.11.1)
Collecting frozendict<2.3.4
  Downloading frozendict-2.4.4.tar.gz (315 kB)
    Installing build dependencies ... done
    Getting requirements to build wheel ... done
    Preparing wheel metadata ... done
Requirement already satisfied: numpy>=1.16.5 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from yfinance) (1.21.5)
Collecting peewee<3.16.2
  Downloading peewee-3.17.6.tar.gz (3.0 MB)
    Downloading peewee-3.17.6.tar.gz (3.0 MB)
    Installing build dependencies ... done
    Getting requirements to build wheel ... done
    Preparing wheel metadata ... done
Requirement already satisfied: soupsieve>1.2 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from beautifulsoup4>=4.11.1->yfinance) (2.3.1)
Requirement already satisfied: webencodings in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from htmllib>=1.1->yfinance) (0.5.1)
Requirement already satisfied: six>=1.9 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from htmllib>=1.1->yfinance) (1.16.0)
Requirement already satisfied: charset-normalizer<4.0.0 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from pandas=1.3.0->yfinance) (2.6.2)
Requirement already satisfied: idna>=2.5 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from requests>=2.31->yfinance) (3.3)
Requirement already satisfied: urllib3<3.0,=>1.21.1 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from requests>=2.31->yfinance) (1.26.9)
Requirement already satisfied: charset-normalizer<4.0.0 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from requests>=2.31->yfinance) (2.6.2)
Requirement already satisfied: certifi>=2017.4.17 in /Users/apple/opt/anaconda3/lib/python3.9/site-packages (from requests>=2.31->yfinance) (2024.6.2)
Building wheels for collected packages: frozendict, peewee
  Building wheel for frozendict (PEP 517) ... done
  Created wheel for frozendict: filename=frozendict-2.4.4-cp39-cp39-macosx_10_9_x86_64.whl size=16033 sha256=6d8f0409ee8e56166f69eac95ac8b6bd33b4d899e873d47ab3469
  Stored in directory: /Users/apple/Library/Caches/pip/wheels/fa/a3/fa/ee5dd1c7ded39e90b84882f2f272ab9f8801eafbf7945c214
  Building wheel for peewee (PEP 517) ... done
  Created wheel for peewee: filename=peewee-3.17.6-py3-none-any.whl size=138992 sha256=08c437b764ee8d25ff601d44e6f59d4759493d47d9030897e9ddeeef44e4e5
  Stored in directory: /Users/apple/Library/Caches/pip/wheels/3e/23/b4/7729b2d48a34ee9d5c11f7f8d4d4ff0571a056e2691110b34
Successfully built frozendict peewee
Installing collected packages: pytz, requests, platformdirs, peewee, multitasking, lxml, htmllib, frozendict, yfinance
  Attempting uninstall: pytz
    Found existing installation: pytz 2021.3
    Uninstalling pytz-2021.3:
      Successfully uninstalled pytz-2021.3
  Attempting uninstall: requests
    Found existing installation: requests 2.27.1
    Uninstalling requests-2.27.1:
      Successfully uninstalled requests-2.27.1
  Attempting uninstall: lxml
    Found existing installation: lxml 4.8.0
    Uninstalling lxml-4.8.0:
      Successfully uninstalled lxml-4.8.0
ERROR: pip's dependency resolver does not currently take into account all the packages that are installed. This behaviour is the source of the following dependency
conda-repo-ol1.0.4 requires pathlib, which is not installed.
conda-project 3.0.2 requires pathlib, which is not installed.
Successfully installed frozendict-2.4.4 htmllib-1.1 lxml-5.3.0 multitasking-0.0.11 peewee-3.17.6 platformdirs-4.2.2 pytz-2024.1 requests-2.32.3 yfinance-0.2.41
Note: you may need to restart the kernel to use updated packages.
```

```
In [2]: import pandas as pd
import yfinance as yf
from datetime import date, timedelta

# define the time period for the data
end_date = date.today().strftime("%Y-%m-%d")
start_date = (date.today() - timedelta(days=365)).strftime("%Y-%m-%d")

# list of stock tickers to download
tickers = ['RELIANCE.NS', 'TCS.NS', 'INFY.NS', 'HDFCBANK.NS']

data = yf.download(tickers, start=start_date, end=end_date, progress=False)

# reset index to bring Date into the columns for the melt function
data = data.reset_index()

# melt the DataFrame to make it long format where each row is a unique combination of Date, Ticker, and attributes
data_melted = data.melt(id_vars=['Date'], var_name='Attribute', 'Ticker')

# pivot the melted DataFrame to have the attributes (Open, High, Low, etc.) as columns
data_pivoted = data_melted.pivot_table(index=['Date', 'Ticker'], columns='Attribute', values='value', aggfunc='first')

# reset index to turn multi-index into columns
stock_data = data_pivoted.reset_index()

print(stock_data.head())

Attribute      Date      Ticker      Adj Close      Close      High \
0      2023-08-22  HDFCBANK.NS      1561.378602      1582.699951      1598.000000
1      2023-08-22      INFY.NS      1378.046021      1403.750000      1406.050049
2      2023-08-22  RELIANCE.NS      2510.877930      2519.399902      2537.949951
3      2023-08-22      TCS.NS      2325.907715      2382.149902      2411.000000
4      2023-08-22  HDFCBANK.NS      1565.226074      1586.599976      1590.550049

Attribute      Low      Open      Volume
0      1580.000000      1596.349976      16136785.0
1      1396.050024      1404.699951      2890714.0
2      2499.000000      2516.899902      3856222.0
3      3365.050049      3400.000000      1222012.0
4      1573.250050      1580.000000      16249294.0
```

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In [3]: import matplotlib.pyplot as plt
import seaborn as sns

stock_data['Date'] = pd.to_datetime(stock_data['Date'])

stock_data.set_index('Date', inplace=True)
stock_data.reset_index(inplace=True)
plt.figure(figsize=(14, 7))
sns.set(style='whitegrid')

sns.lineplot(data=stock_data, x='Date', y='Adj Close', hue='Ticker', marker='o')

plt.title('Adjusted Close Price Over Time', fontsize=16)
plt.xlabel('Date', fontsize=14)
plt.ylabel('Adjusted Close Price', fontsize=14)
plt.legend(title='Ticker', title_fontsize='13', fontsize='11')
plt.grid(True)

plt.xticks(rotation=45)

plt.show()
```

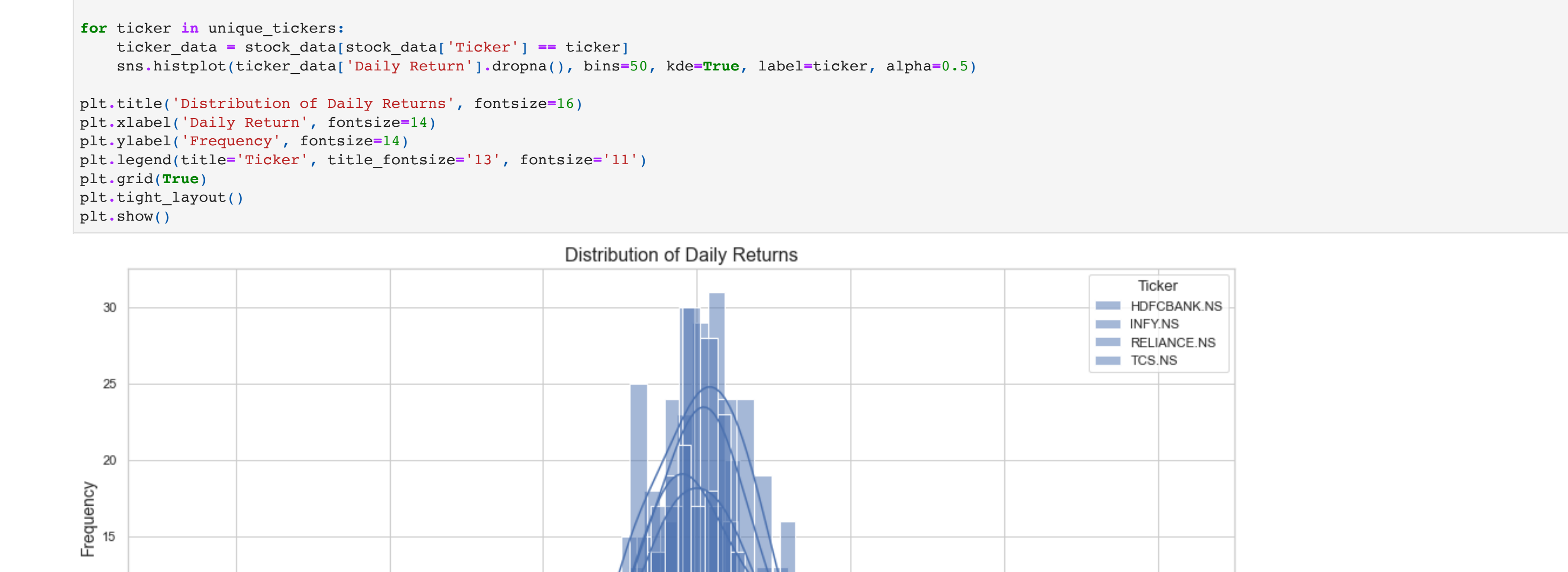
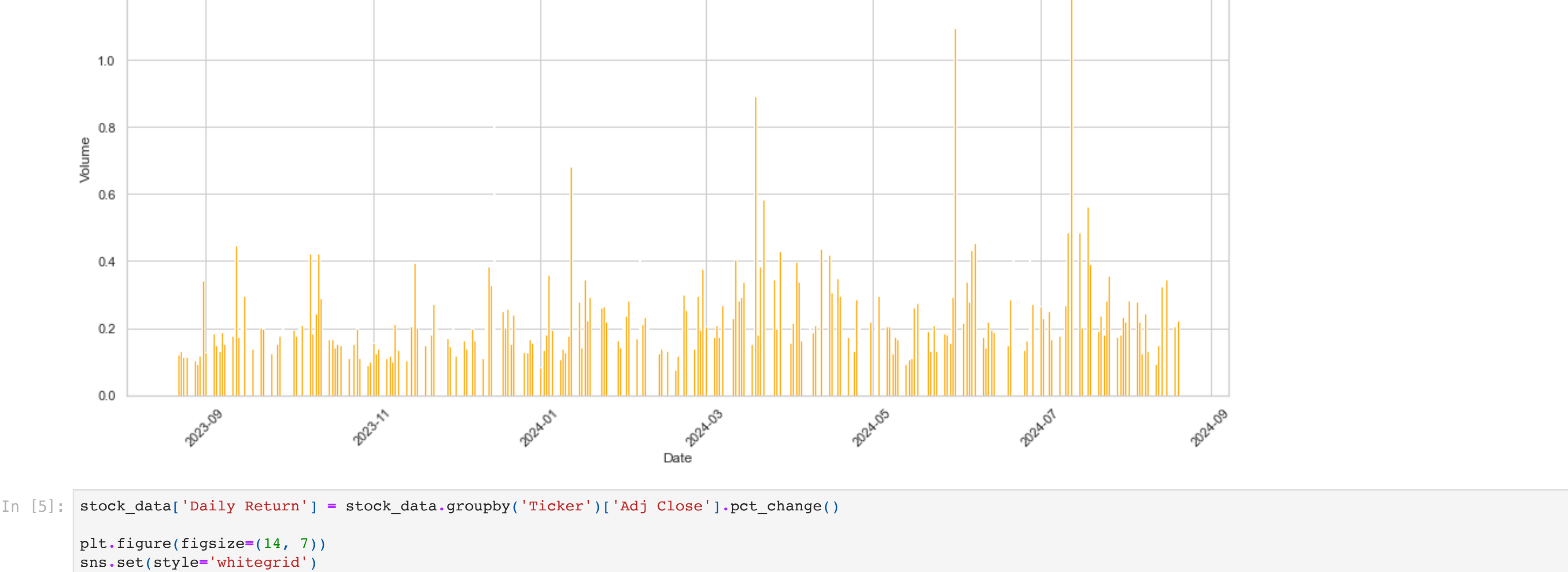
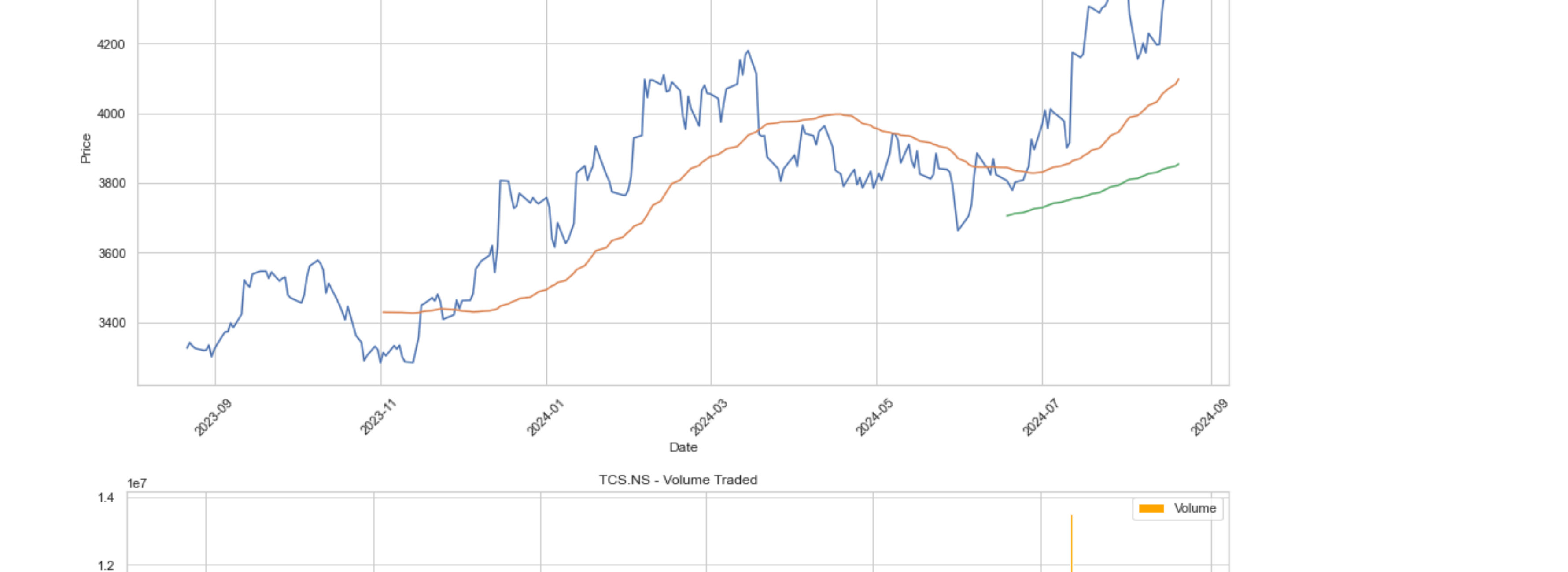
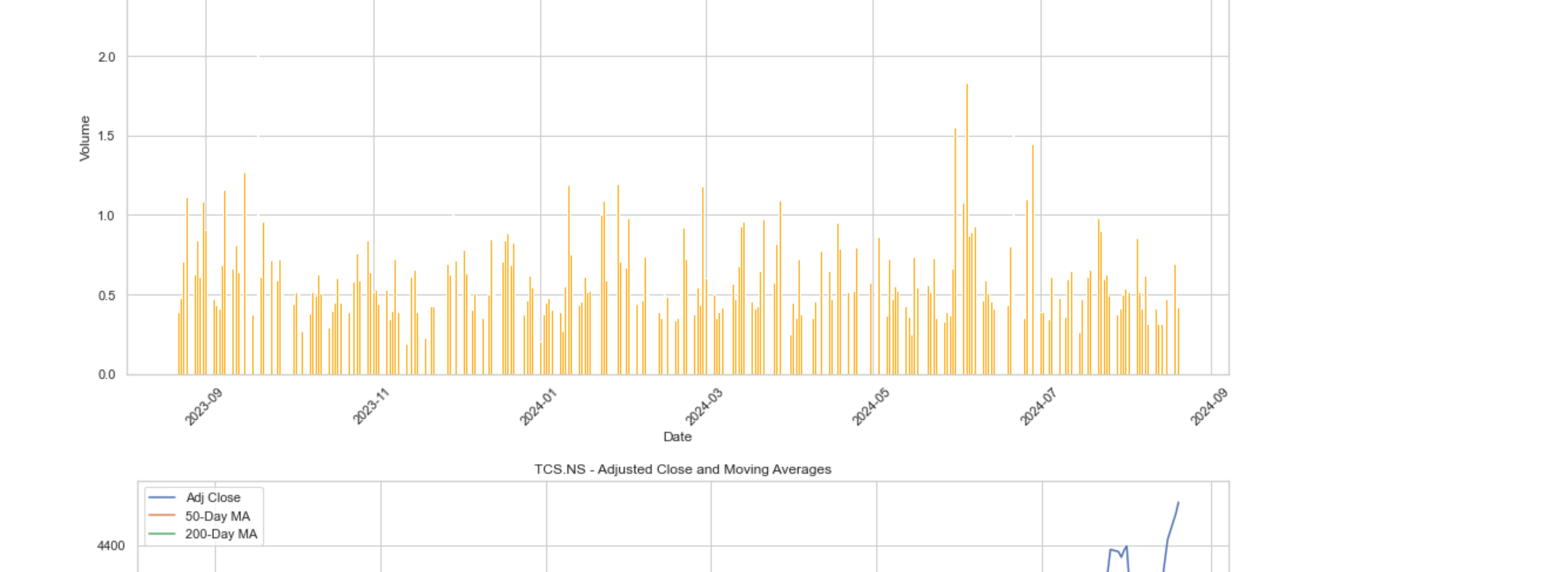
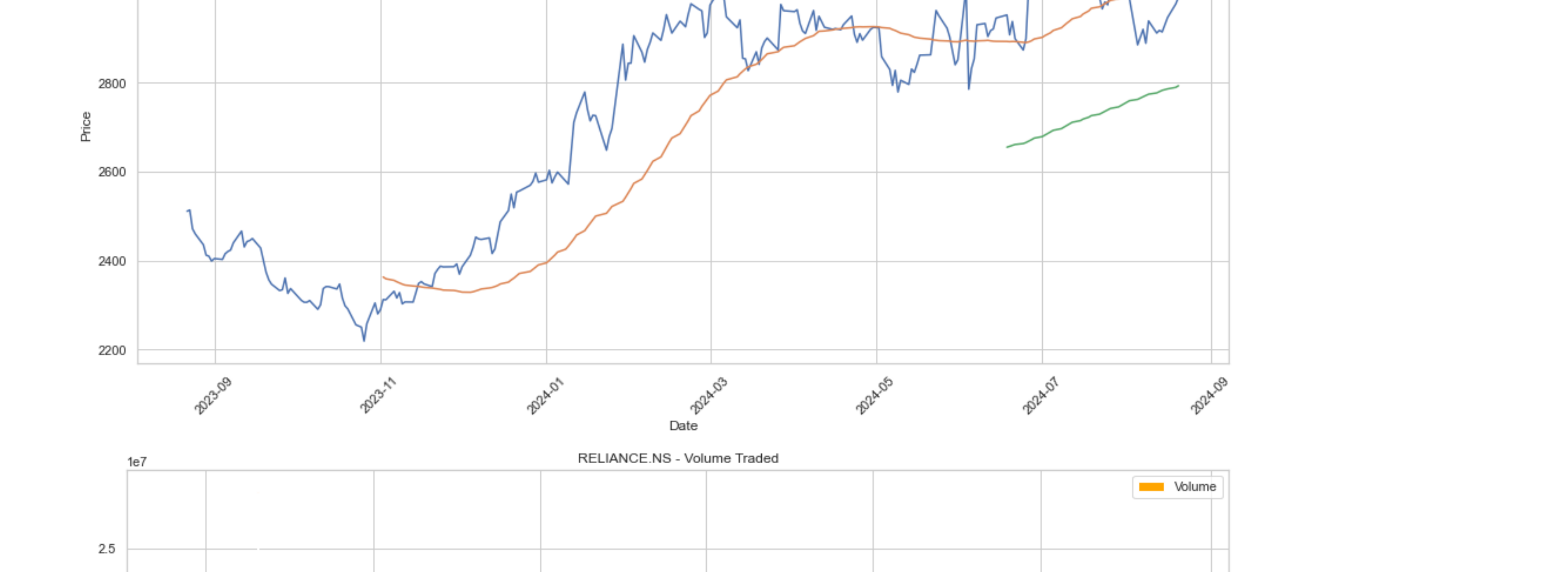
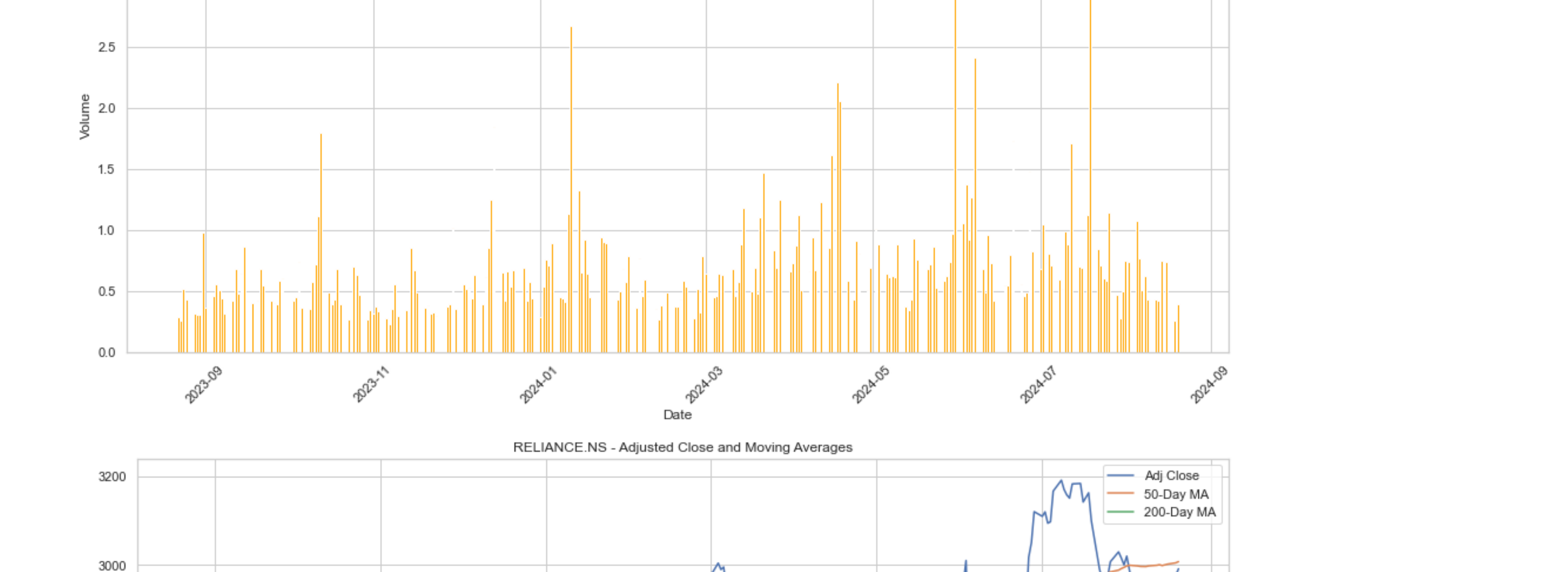
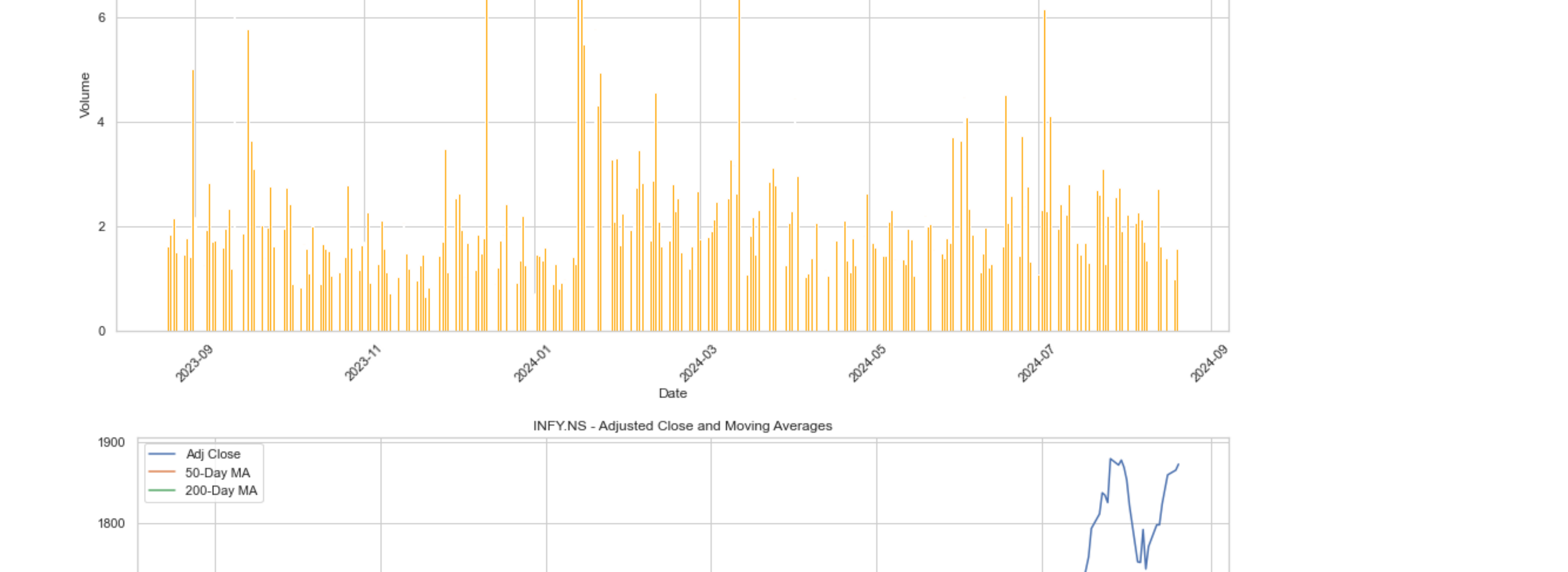
```
In [4]: short_window = 50
long_window = 200

stock_data.set_index('Date', inplace=True)
unique_tickers = stock_data['Ticker'].unique()

for ticker in unique_tickers:
    ticker_data = stock_data[stock_data['Ticker'] == ticker].copy()
    ticker_data['50_MA'] = ticker_data['Adj Close'].rolling(window=short_window).mean()
    ticker_data['200_MA'] = ticker_data['Adj Close'].rolling(window=long_window).mean()

    plt.figure(figsize=(14, 7))
    plt.plot(ticker_data.index, ticker_data['Adj Close'], label='Adj Close')
    plt.plot(ticker_data.index, ticker_data['50_MA'], label='50-day MA')
    plt.plot(ticker_data.index, ticker_data['200_MA'], label='200-day MA')
    plt.title(f'{ticker} - Adjusted Close and Moving Averages')
    plt.xlabel('Date')
    plt.ylabel('Price')
    plt.legend()
    plt.grid(True)
    plt.xticks(rotation=45)
    plt.tight_layout()
    plt.show()
```

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plt.figure(figsize=(14, 7))
plt.bar(ticker_data.index, ticker_data['Volume'], label='Volume', color='orange')
plt.title(f'{ticker} - Volume Traded')
plt.xlabel('Date')
plt.ylabel('Volume')
plt.legend()
plt.grid(True)
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```



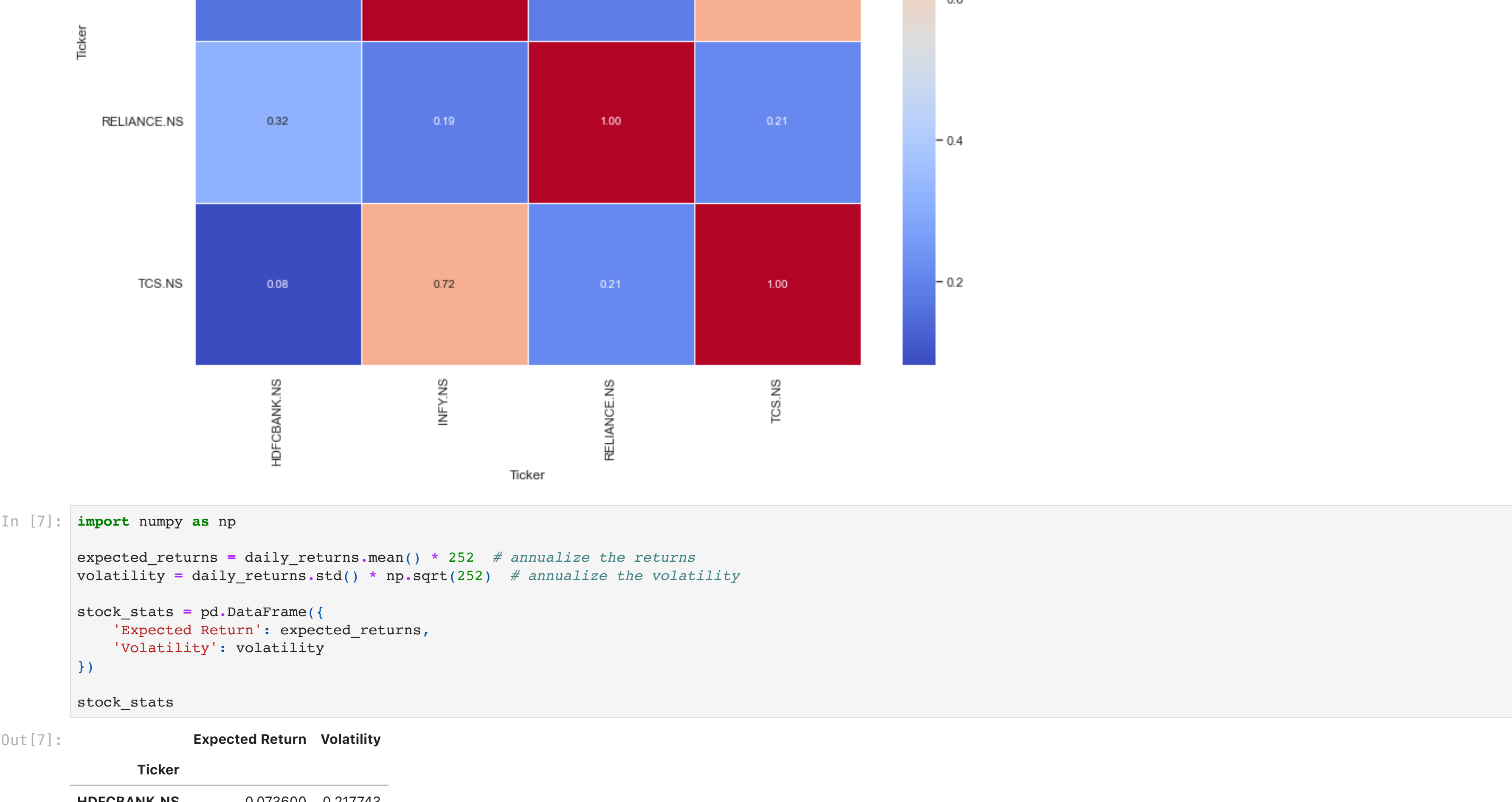
```
In [5]: stock_data['Daily Return'] = stock_data.groupby('Ticker')['Adj Close'].pct_change()

plt.figure(figsize=(14, 7))
sns.set(style='whitegrid')

for ticker in unique_tickers:
    ticker_data = stock_data[stock_data['Ticker'] == ticker]
    sns.histplot(ticker_data['Daily Return'], dropna=True, kde=True, label=ticker, alpha=0.5)

plt.title('Distribution of Daily Returns', fontsize=16)
plt.xlabel('Daily Return', fontsize=14)
plt.ylabel('Frequency', fontsize=14)
plt.legend(title='Ticker', title_fontsize='13', fontsize='11')
plt.grid(True)
plt.tight_layout()
plt.show()
```

```
In [6]: daily_returns = stock_data.pivot_table(index='Date', columns='Ticker', values='Daily Return')
correlation_matrix = daily_returns.corr()
```



```
In [7]: import numpy as np

expected_returns = daily_returns.mean() * 252 # annualize the returns
volatility = daily_returns.std() * np.sqrt(252) # annualize the returns

stock_stats = pd.DataFrame({
    'Expected Return': expected_returns,
    'Volatility': volatility
})

stock_stats
```

```
Out[7]:
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	Ticker	Expected Return	Volatility
	HDFCBANK.NS	0.079800	0.217743
	INFY.NS	0.343346	0.220748
	RELIANCE.NS	0.205248	0.213408
	TCS.NS	0.341688	0.207071

```
In [8]: # function to calculate portfolio performance
def portfolio_performance(weights, returns, cov_matrix):
    portfolio_return = np.dot(weights, returns)
    portfolio_volatility = np.sqrt(np.dot(weights.T, np.dot(cov_matrix, weights)))
    return portfolio_return, portfolio_volatility

# number of portfolios to simulate
num_portfolios = 10000

# arrays to store the results
results = np.zeros((3, num_portfolios))

# annualized covariance matrix
cov_matrix = daily_returns.cov() * 252

np.random.seed(42)

for i in range(num_portfolios):
    weights = np.random.random(len(unique_tickers))
    weights /= np.sum(weights)

    portfolio_return, portfolio_volatility = portfolio_performance(weights, expected_returns, cov_matrix)

    results[0,i] = portfolio_return
    results[1,i] = portfolio_volatility
    results[2,i] = portfolio_return / portfolio_volatility # Sharpe Ratio

plt.figure(figsize=(10, 7))
plt.scatter(results[1,:], results[0,:], c=results[2,:], cmap='YlOrBu', marker='o')
plt.xlabel('Volatility (Standard Deviation)')
plt.ylabel('Expected Return')
plt.colorbar(label='Sharpe Ratio')
plt.show()
```

```
./var/folders/gbn/2p6c9y3j3gmw7065jn32h0000gq/T/ipykernel_2423/1544045466.py:33: MatplotlibDeprecationWarning: Auto-removal of grids by pcolor() and pcolormesh() is deprecated since 3.5 and will be removed two minor releases later; please call grid(False) first.
plt.colorbar(label='Sharpe Ratio')
```

```
Out[9]:
```

	Ticker	Weight
	HDFCBANK.NS	0.018272
	INFY.NS	0.350955
	RELIANCE.NS	0.335986
	TCS.NS	0.286687

```
Out[10]:
```

	Ticker	Weight
	HDFCBANK.NS	0.018272
	INFY.NS	0.350955
	RELIANCE.NS	0.335986
	TCS.NS	0.286687

```
In [1]:
```